

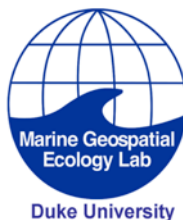


Regional Species Modeling and Data Integration

Jesse Cleary, Patrick N. Halpin

SECOORA Annual Meeting

May 16, 2016





Objectives:

- Cetacean density modeling
- Regional marine life data synthesis

...Data needs and collaborative possibilities

SCIENTIFIC REPORTS

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Habitat-based cetacean density models for the U.S. Atlantic and Gulf of Mexico

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Jason J. Roberts¹, Benjamin D. Best^{1,2}, Laura Mannocci¹, Ei Fujioka¹, Patrick N. Halpin¹, Debra L. Palka³, Lance P. Garrison⁴, Keith D. Mullin⁵, Timothy V. N. Cole³, Christin B. Khan³, William A. McLellan⁶, D. Ann Pabst⁶ & Gwen G. Lockhart⁷

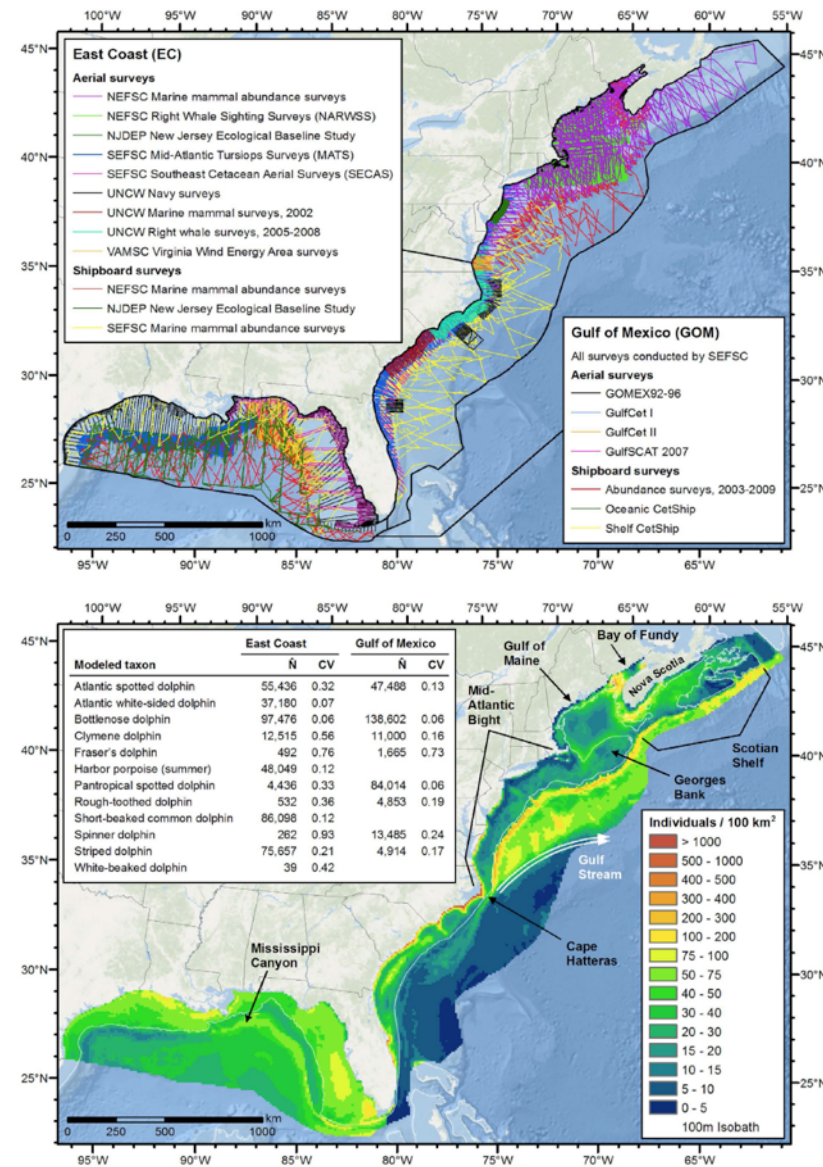
Cetaceans are protected worldwide but vulnerable to incidental harm from an expanding array of human activities at sea. Managing potential hazards to these highly-mobile populations increasingly requires a detailed understanding of their seasonal distributions and habitats. Pursuant to the urgent need for this knowledge for the U.S. Atlantic and Gulf of Mexico, we integrated 23 years of aerial and shipboard cetacean surveys, linked them to environmental covariates obtained from remote sensing and ocean models, and built habitat-based density models for 26 species and 3 multi-species guilds using distance sampling methodology. In the Atlantic, for 11 well-known species, model predictions resembled seasonal movement patterns previously suggested in the literature. For these we produced monthly mean density maps. For lesser-known taxa, and in the Gulf of Mexico, where seasonal movements were less well described, we produced year-round mean density maps. The results revealed high regional differences in small delphinoid densities, confirmed the importance of the continental slope to large delphinoids and of canyons and seamounts to beaked and sperm whales, and quantified seasonal shifts in the densities of migratory baleen whales. The density maps, freely available online, are the first for these regions to be published in the peer-reviewed literature.

The International Whaling Commission placed a moratorium on commercial whaling in 1986, curtailing the biggest direct anthropogenic threat to many cetacean populations. But other threats have persisted, such as bycatch in fisheries¹, ship strikes^{2,4}, oil spills^{3,4}, and other pollutants⁵. New threats have been recognized, including naval active sonar⁶⁻⁸, other anthropogenic sources of noise^{9,10}, and climate change¹¹. In the United States, national laws protect cetaceans. The Marine Mammal Protection Act (MMPA) prohibits intentional or incidental killing, injuring, or harassment of cetaceans and specifies the circumstances and rules under which permits may be issued for such activities. The Endangered Species Act (ESA) prohibits harm to species threatened with extinction, including 16 cetacean species, and requires conservation of their habitat. The National Environmental Policy Act (NEPA) specifies the process by which U.S. national government agencies must evaluate the potential environmental effects of their actions, consider alternatives, and conduct public reviews. Agency actions that involve decisions to issue permits under the MMPA or ESA are usually subject to this process.

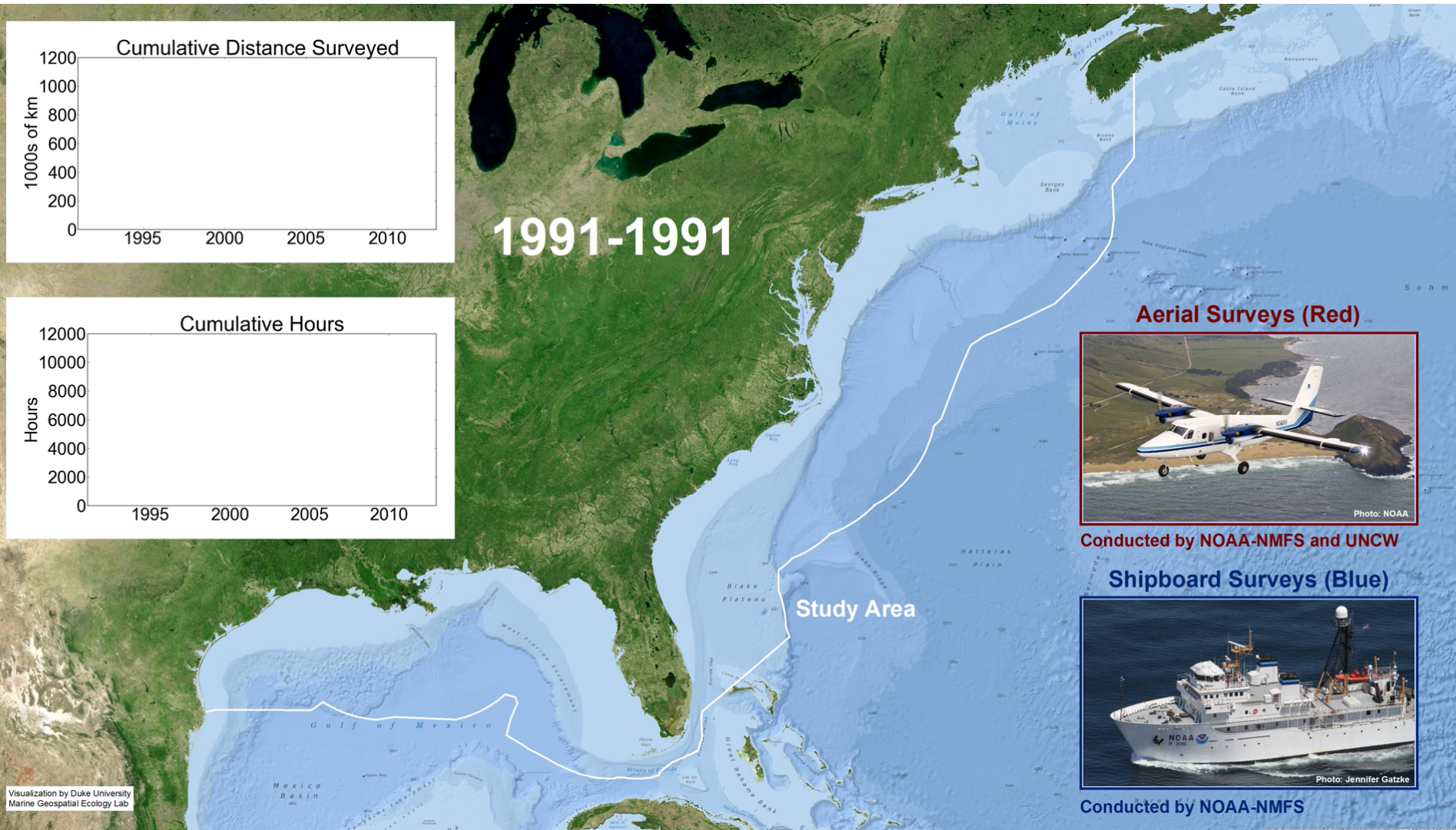
To evaluate the potential effects of proposed activities on cetacean populations, interested parties require a detailed understanding of the spatiotemporal distributions of these populations. Recent developments have created an urgent need for this information in U.S. waters of the Atlantic and Gulf of Mexico, when the U.S. Bureau of Ocean Energy Management (BOEM) proposed to open a large portion of the Atlantic continental shelf to oil and natural gas development and to expand oil and gas leasing in the Gulf of Mexico. Concurrently, the U.S. Navy began development of a new Environmental Impact Statement assessing the effects of training activities proposed for a large portion of the western North Atlantic, while the National Marine Fisheries Service (NMFS) proposed

¹Marine Geospatial Ecology Laboratory, Nicholas School of the Environment, Duke University, Durham, NC, USA. ²Bren School of Environmental Sciences and Management, University of California, Santa Barbara, CA, USA. ³Northeast Fisheries Science Center, National Marine Fisheries Service, Woods Hole, MA, USA. ⁴Southeast Fisheries Science Center, National Marine Fisheries Service, Miami, FL, USA. ⁵Southeast Fisheries Science Center, National Marine Fisheries Service, Pascagoula, MS, USA. ⁶Biology and Marine Biology, University of North Carolina Wilmington, NC, USA. ⁷Virginia Aquarium & Marine Science Center, Virginia Beach, VA, USA. Correspondence and requests for materials should be addressed to J.J.R. (email: jason.roberts@duke.edu)

<http://www.nature.com/articles/srep22615>

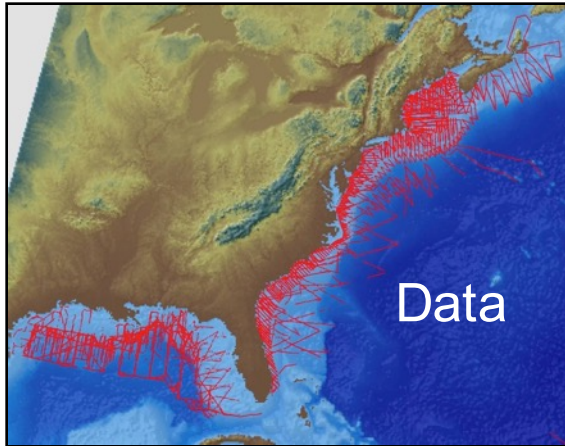


Marine mammal aggregation data overview

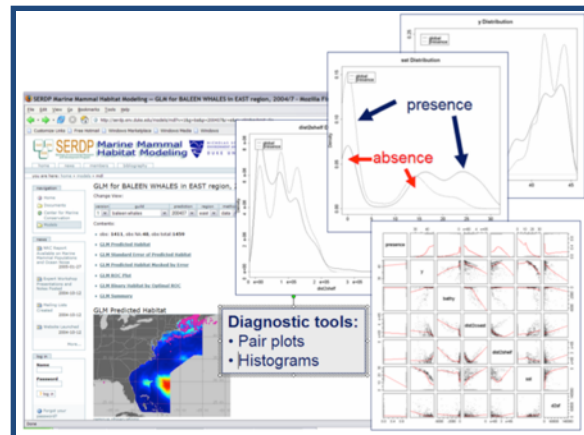
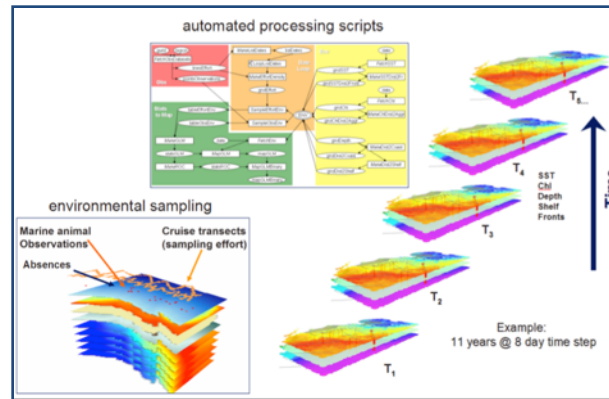


Cetacean habitat modeling process

1: observation data aggregation



2: fusion with oceanographic data



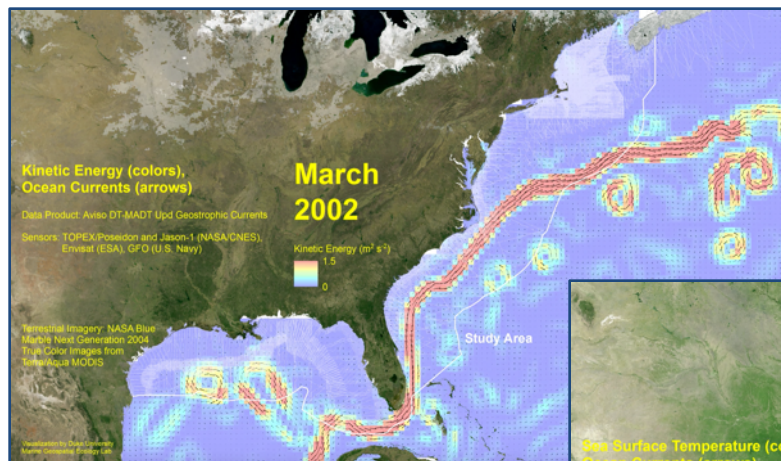
3: statistical modeling

4: model product development

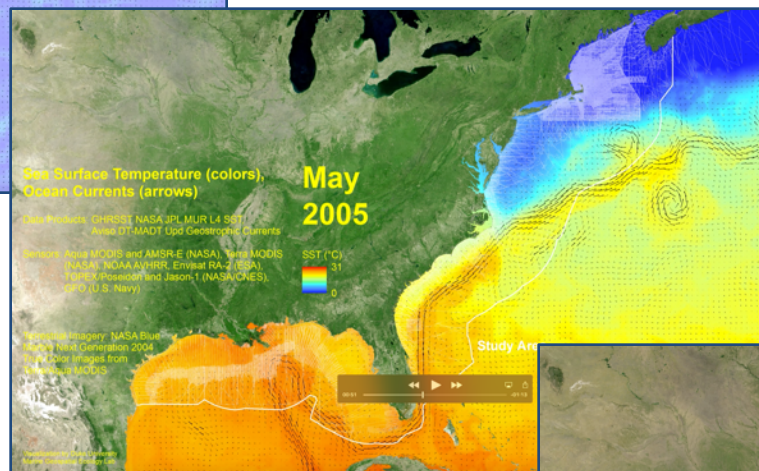


Dynamic oceanographic predictor variables

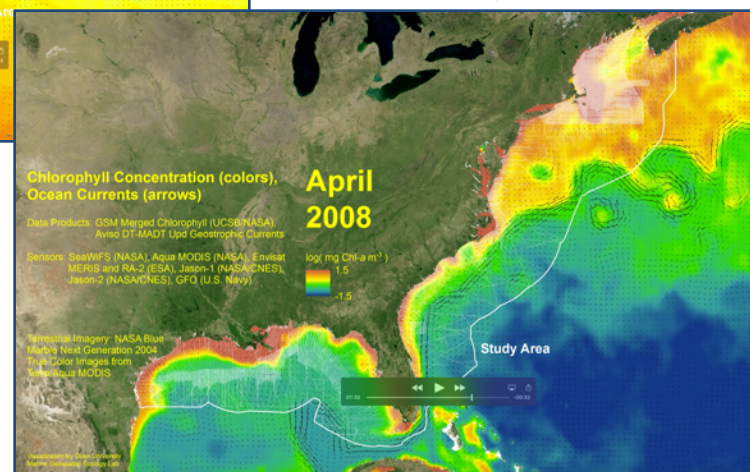
currents, eddys & kinetic energy



sea surface temperature



chlorophyll a



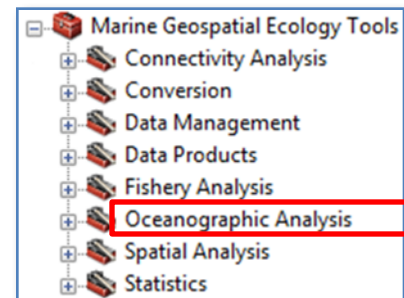
Physical oceanographic predictors

Predictor	Description
SST	Taken from GHR SST CMC 2.0 L4 0.2° daily SST, interpolated up to 10 km resolution
DistToFront	Distance to closest SST front detected in CMC SST using Canny edge detection operator. Tested several alternative formulations.
DistToEddy, DistToAEddy, DistToCEddy	Distance to ring of closest geostrophic eddy having any/anticyclonic/cyclonic polarity, from Chelton et al. (2011) database. Tested eddies at least 9 weeks old, at least 4 weeks old, and without a minimum age.
TKE, EKE	Total kinetic energy and eddy kinetic energy derived from AVISO 1/4° DUACS 2014 geostrophic currents, interpolated up to 10km resolution
WindSpeed	30 day running mean of NCDC 1/4° Blended Sea Winds

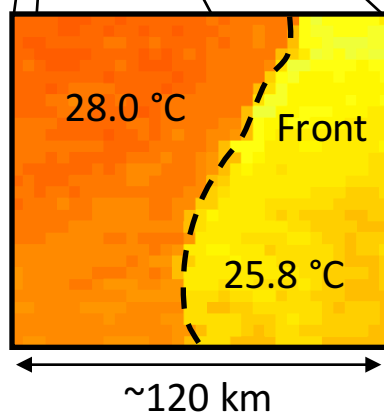
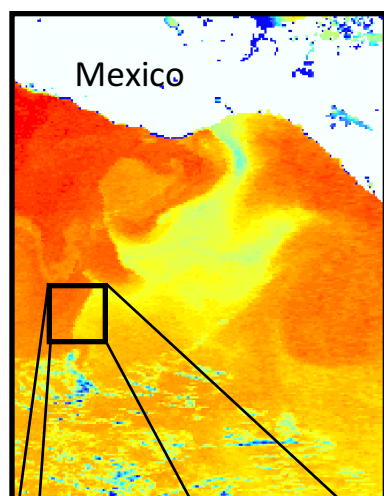
Identify fronts in SST images

MGET: Marine Geospatial Ecology Tools

Roberts *et al.* 2010

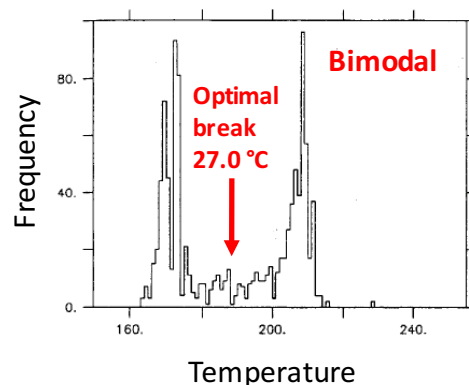


AVHRR Daytime SST
03-Jan-2005

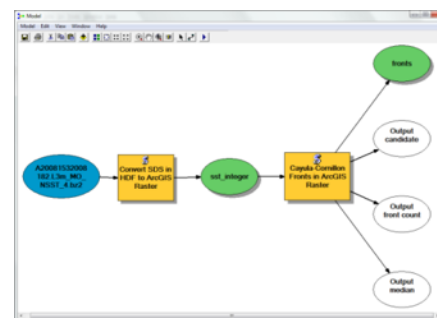


Cayula and Cornillion (1992) edge detection algorithm

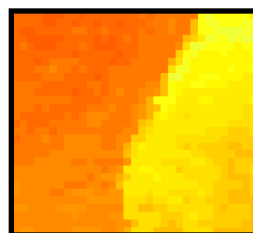
Step 1: Histogram analysis



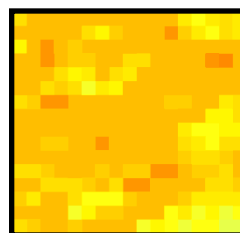
ArcGIS model



Step 2: Spatial cohesion test

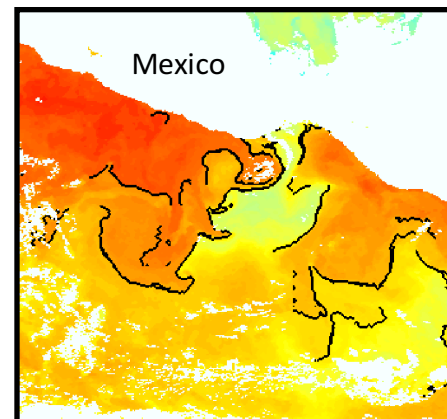


Strong cohesion
→ front present



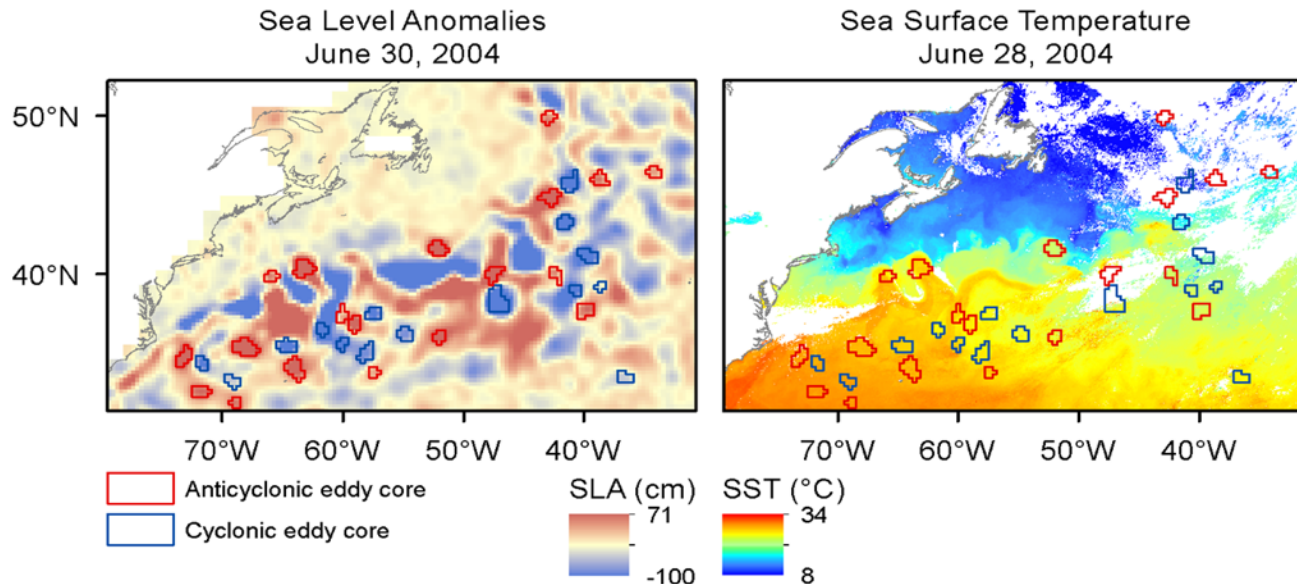
Weak cohesion
→ no front

Example output



Dynamic oceanographic covariates

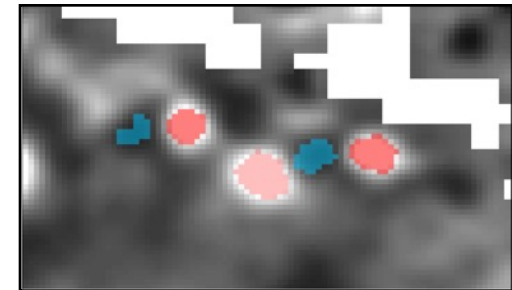
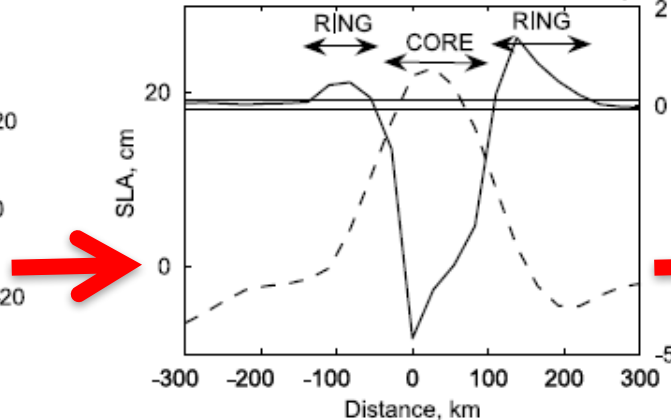
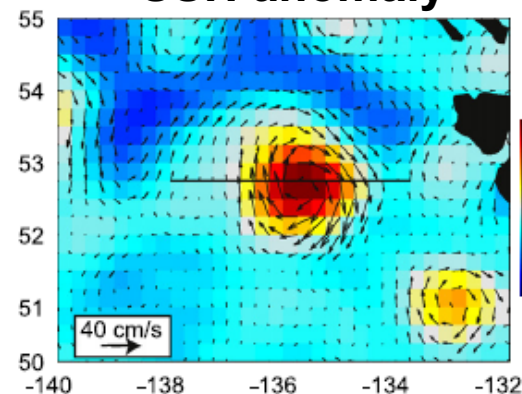
Detecting sea height anomalies & eddys



SSH anomaly

Okubo-Weiss Detection algorithm

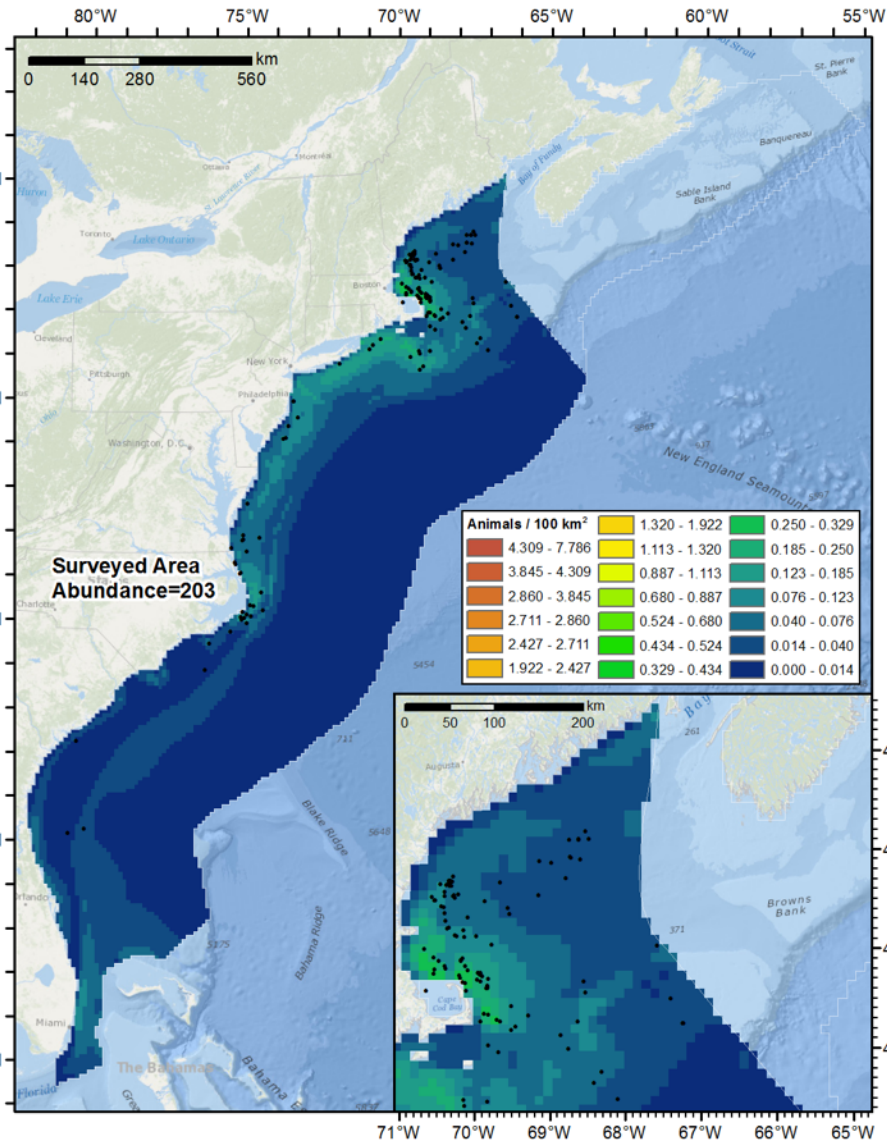
Derived eddy features



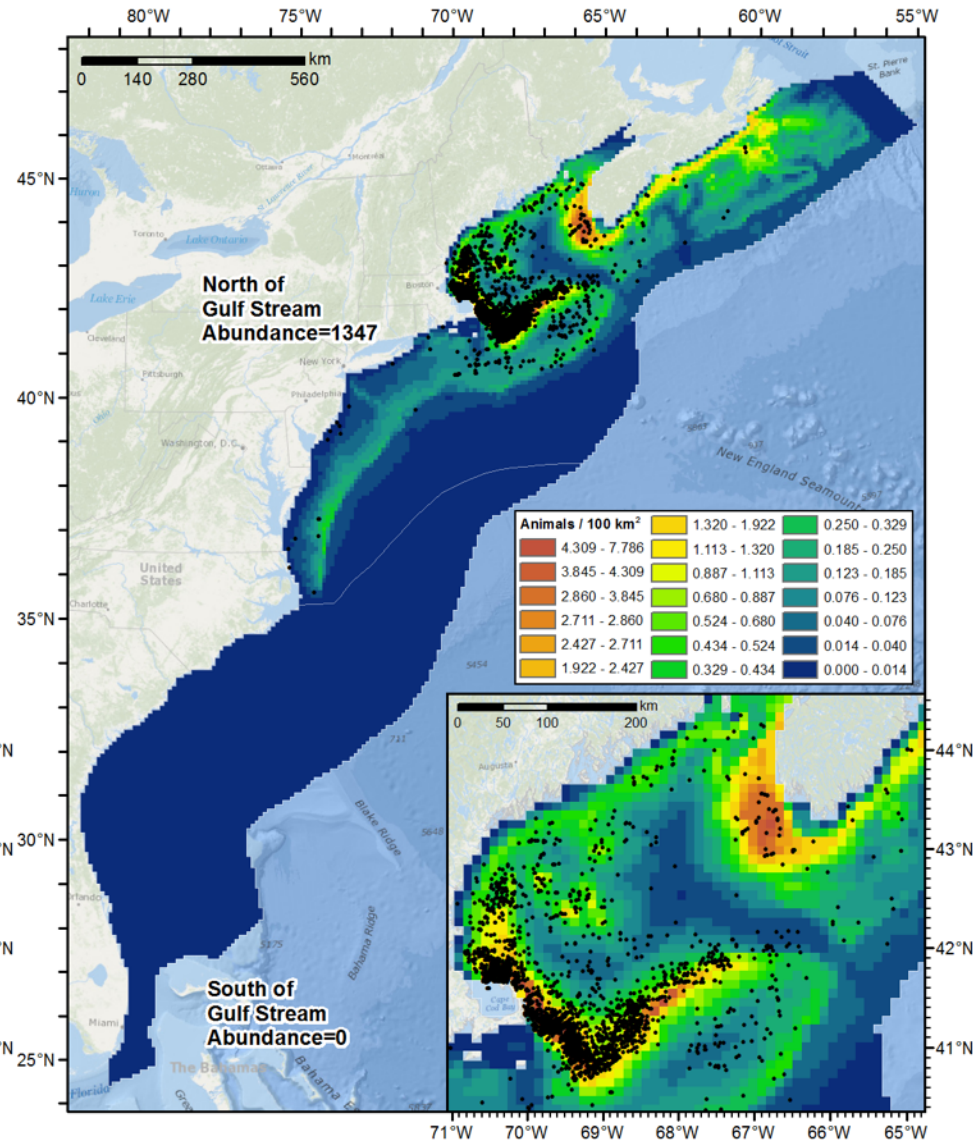
Aviso DT-MSLA 27-Jan-1993
Red: Anticyclonic Blue: Cyclonic

Humpback whales

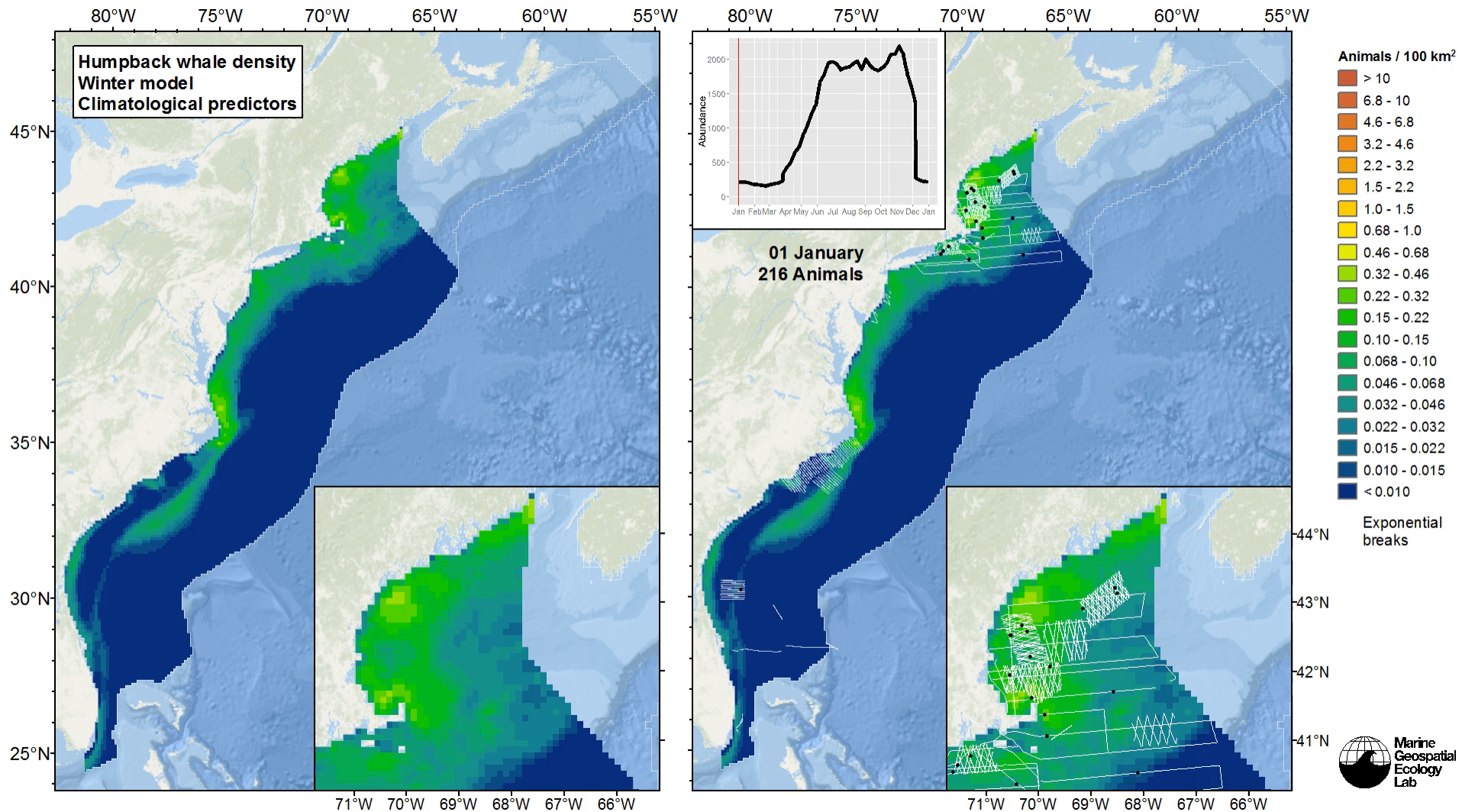
Winter



Summer



Humpback whale, predicted daily to illustrate dynamics



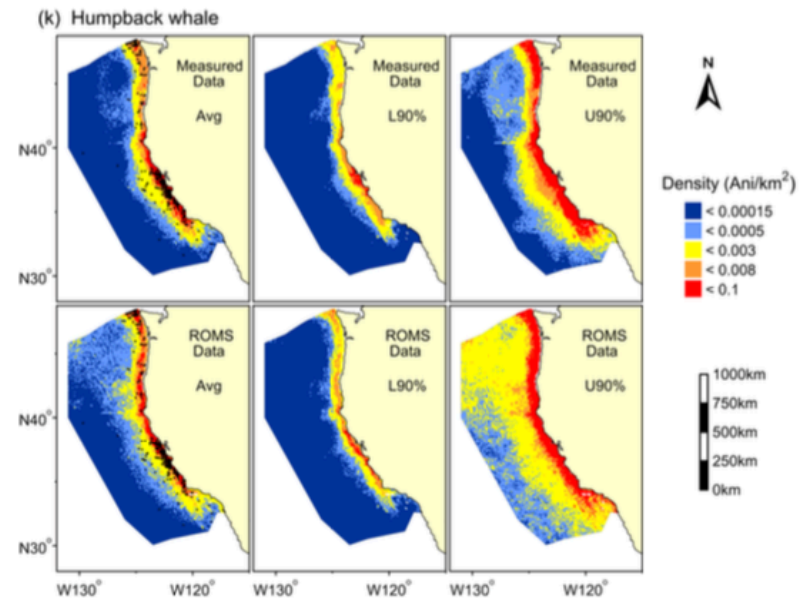
Formal result was 12 monthly summary maps



Data Needs and Collaborative Opportunities

Ocean circulation models and observations to improve cetacean model predictors

- Improve resolution
- Hindcasting, Forecasting



Becker *et al.* 2016



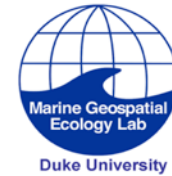
Objectives:

- Cetacean density modeling
- Regional marine life data integration

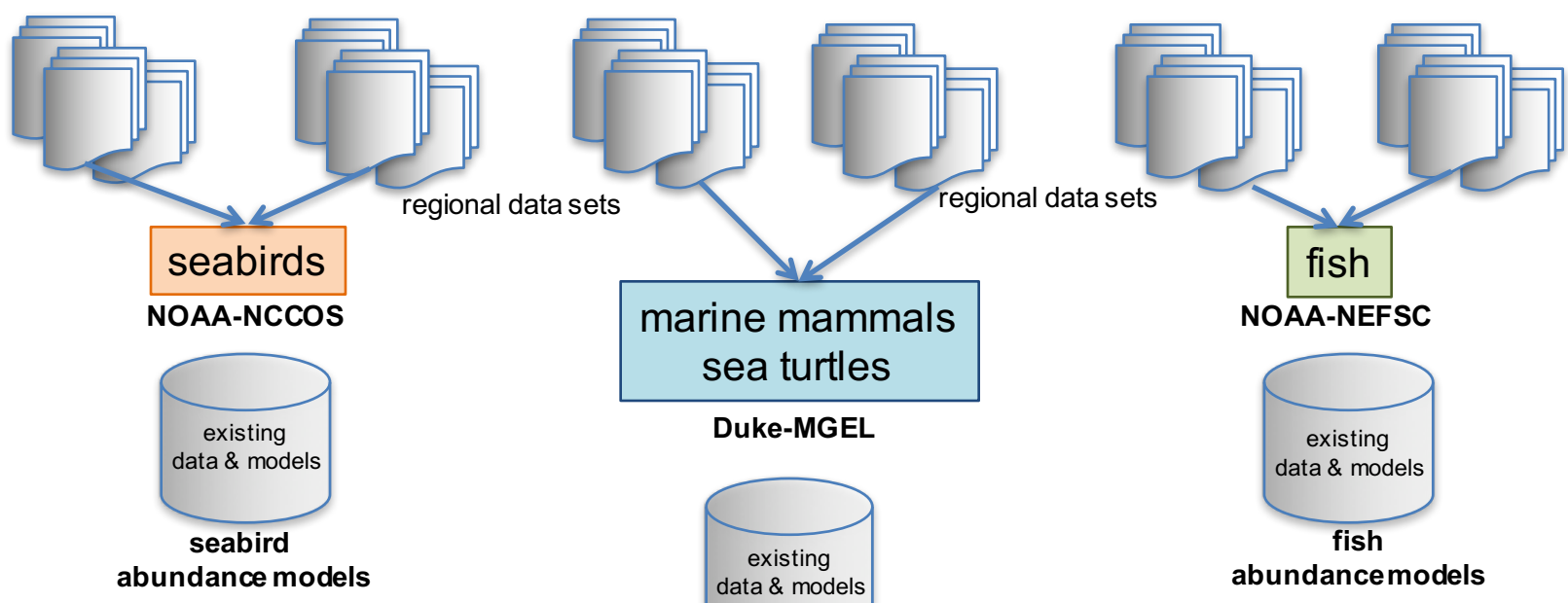


MDAT

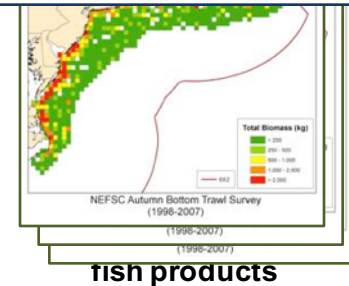
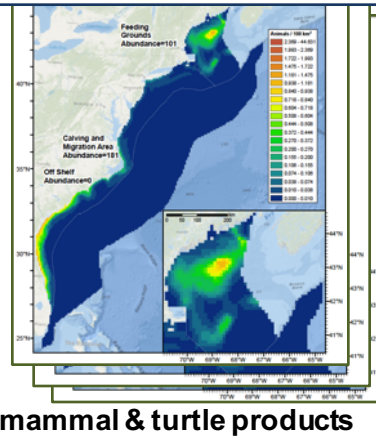
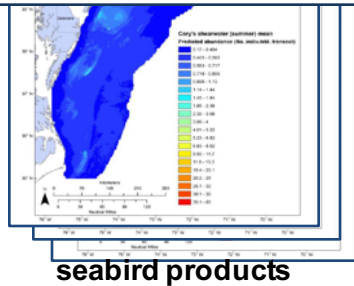
Marinelife Data & Analysis Team



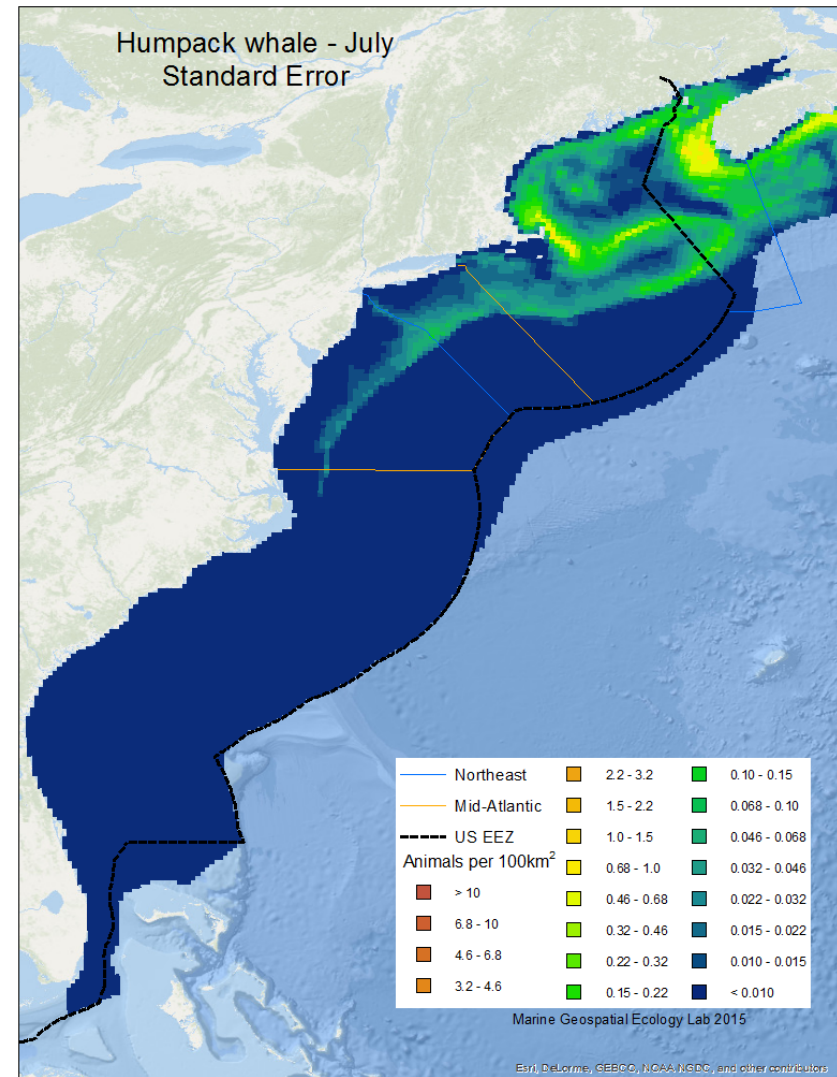
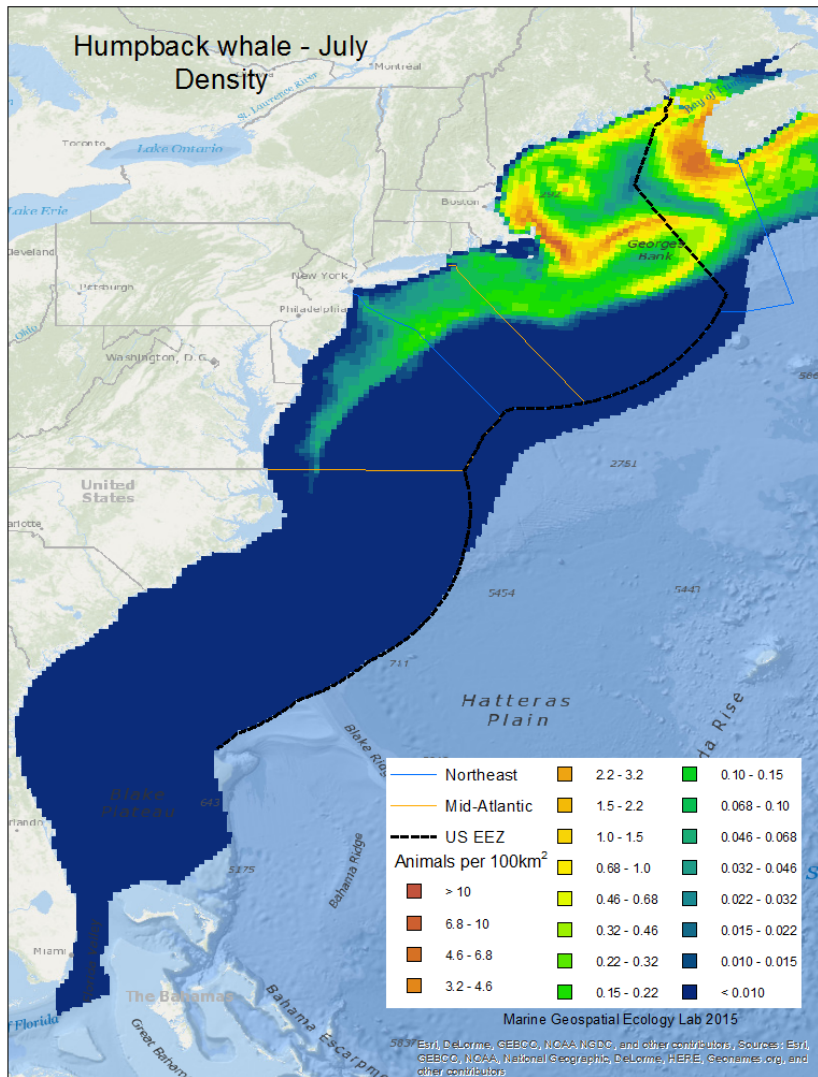
We are working on preparing data for the region but there is no official **RPB** planning process underway.



We have created more than 3,500 model outputs / map layers for the North East & Mid-Atlantic regional ocean plans.

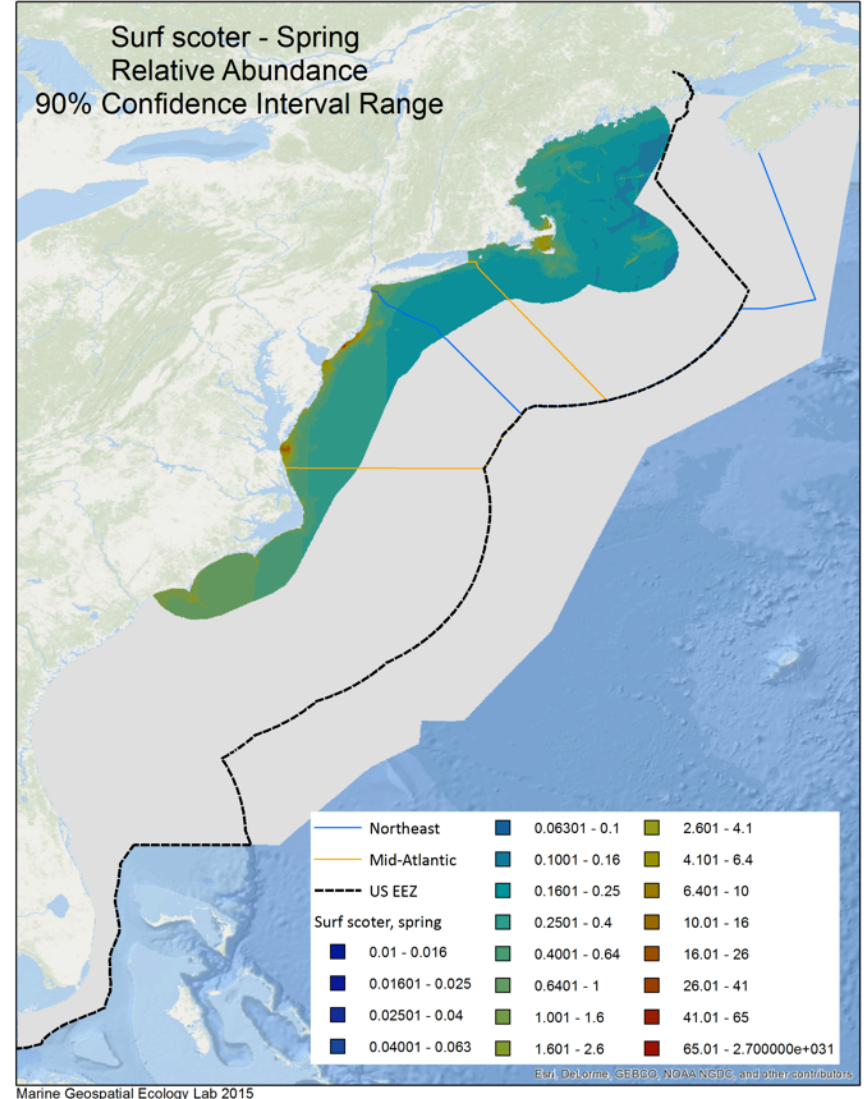
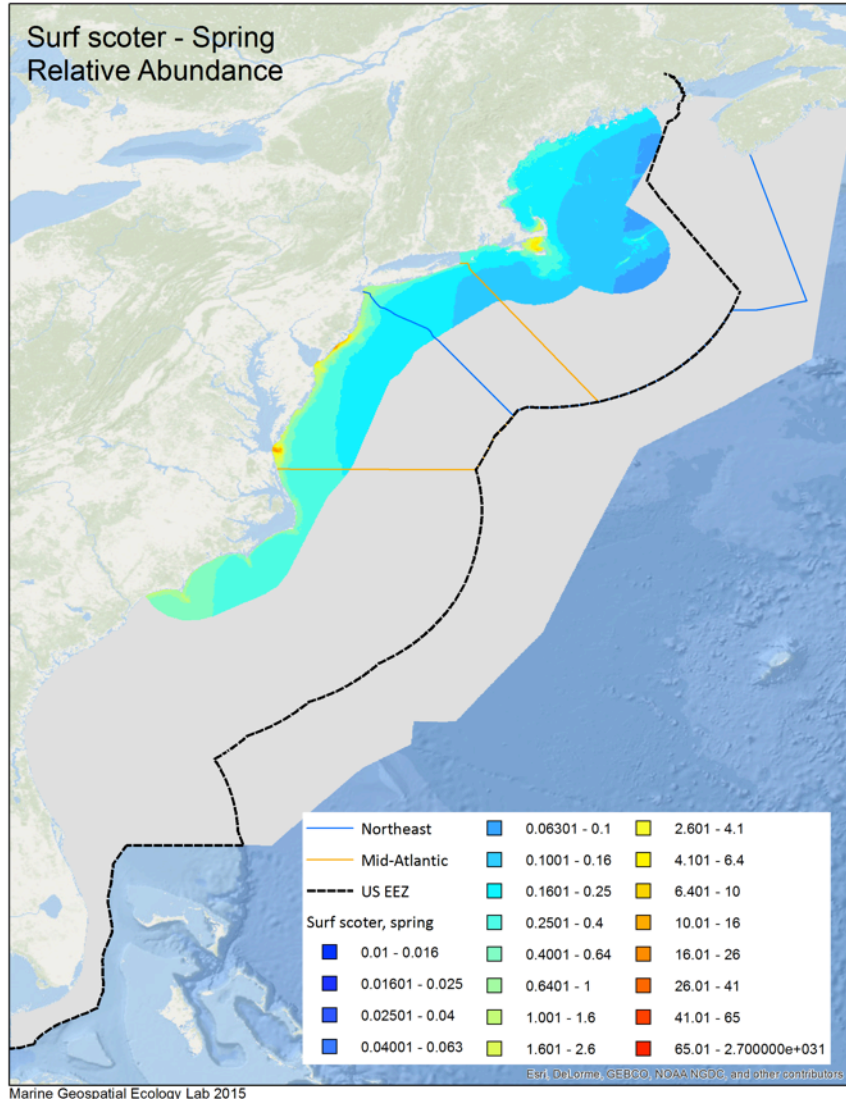


Mammal base product – Humpback whale (*Megaptera novaeanglia*) density & uncertainty

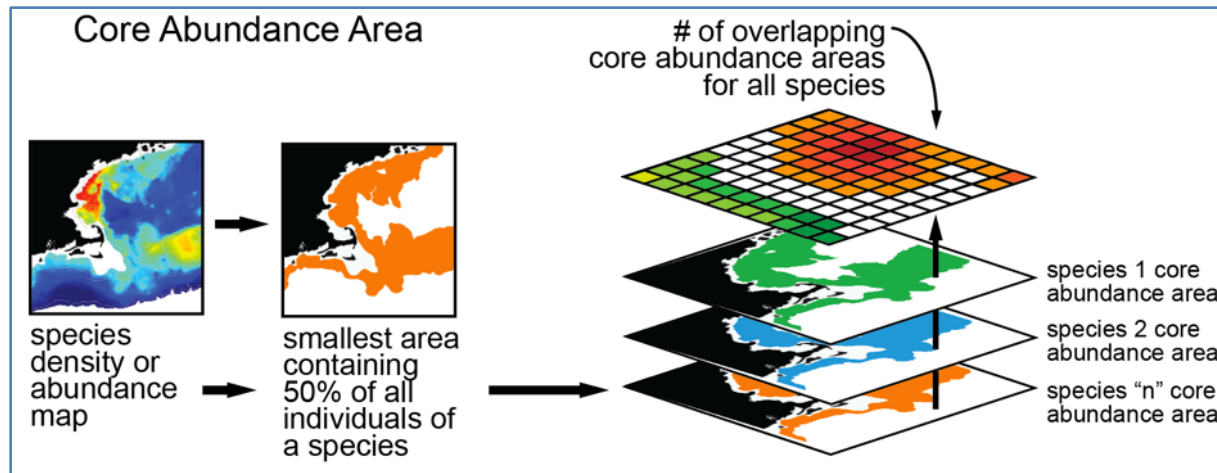
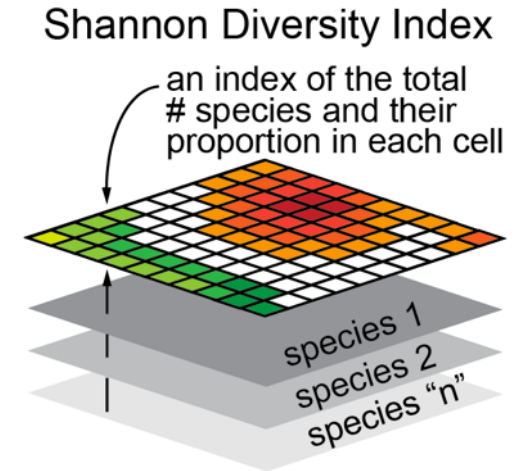
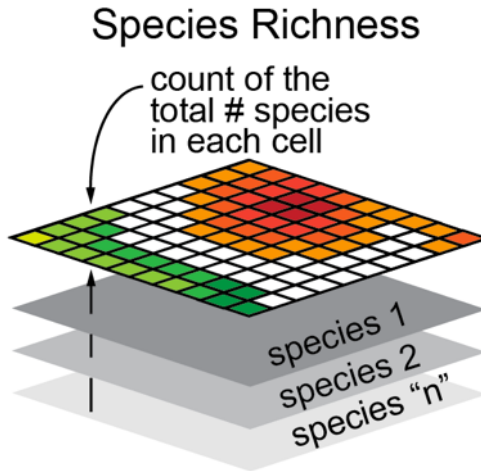
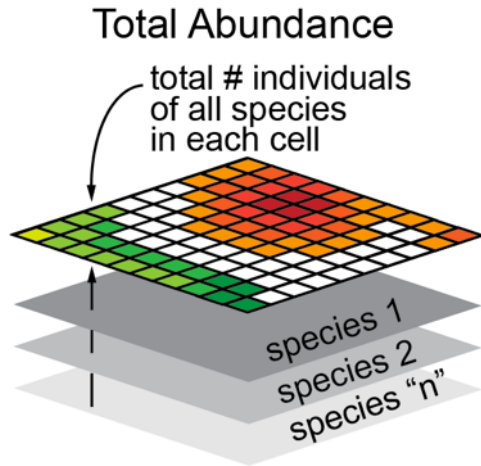


Avian base product – Surf Scoter (*Melanitta perspicillata*)

Abundance & Uncertainty

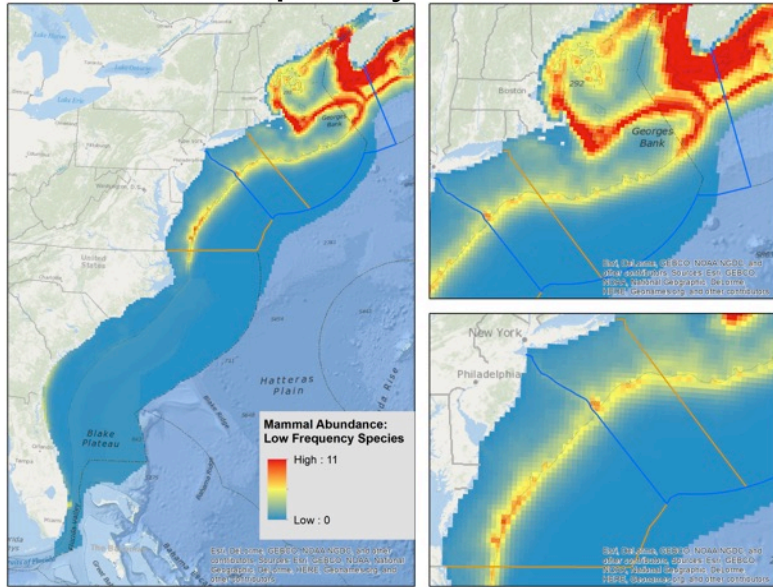


Species Groups: Ecological, Biological, Management-relevant

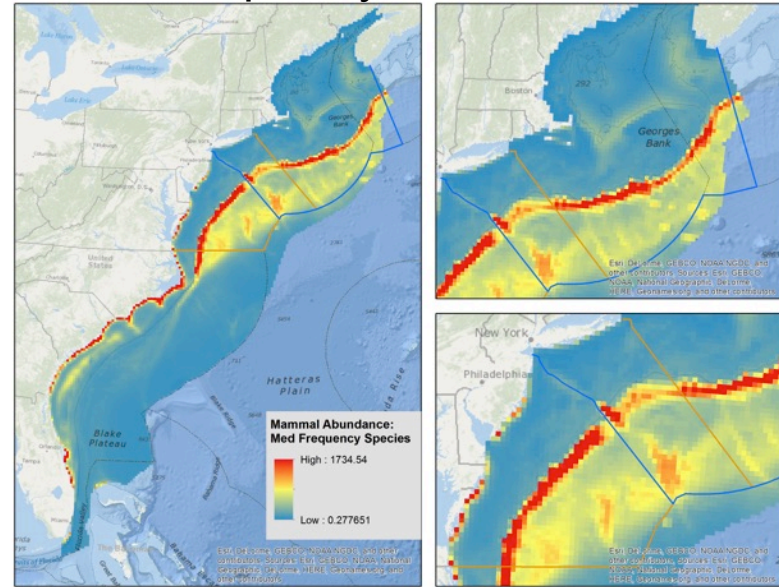


Groups: Cetacean sound use & potential sensitivity to masking

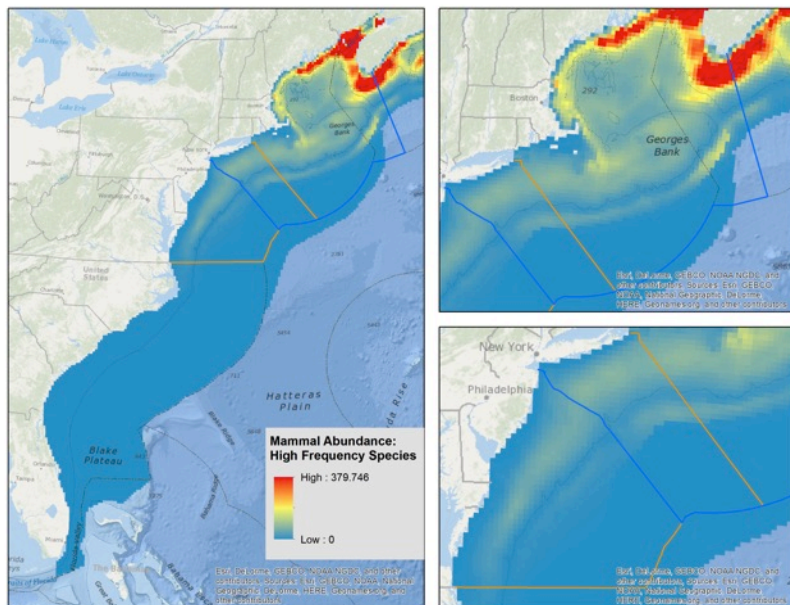
Low-frequency cetaceans



Mid-frequency cetaceans



High frequency cetaceans

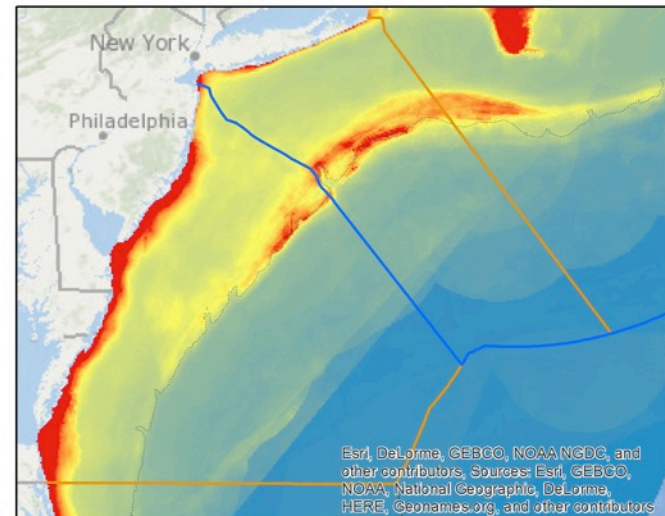
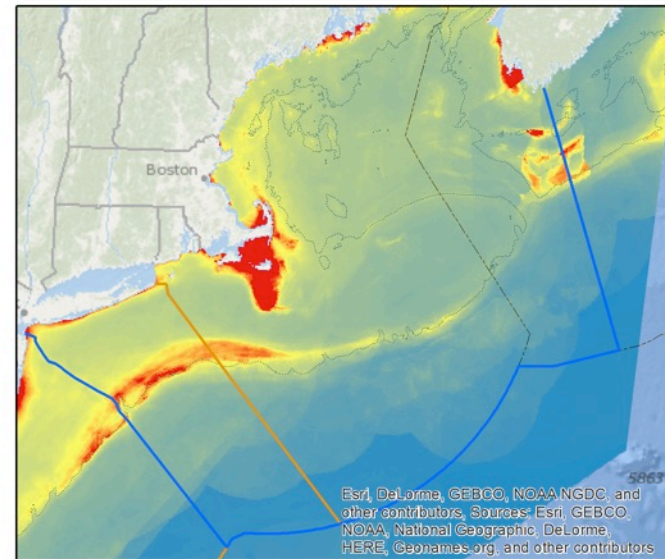
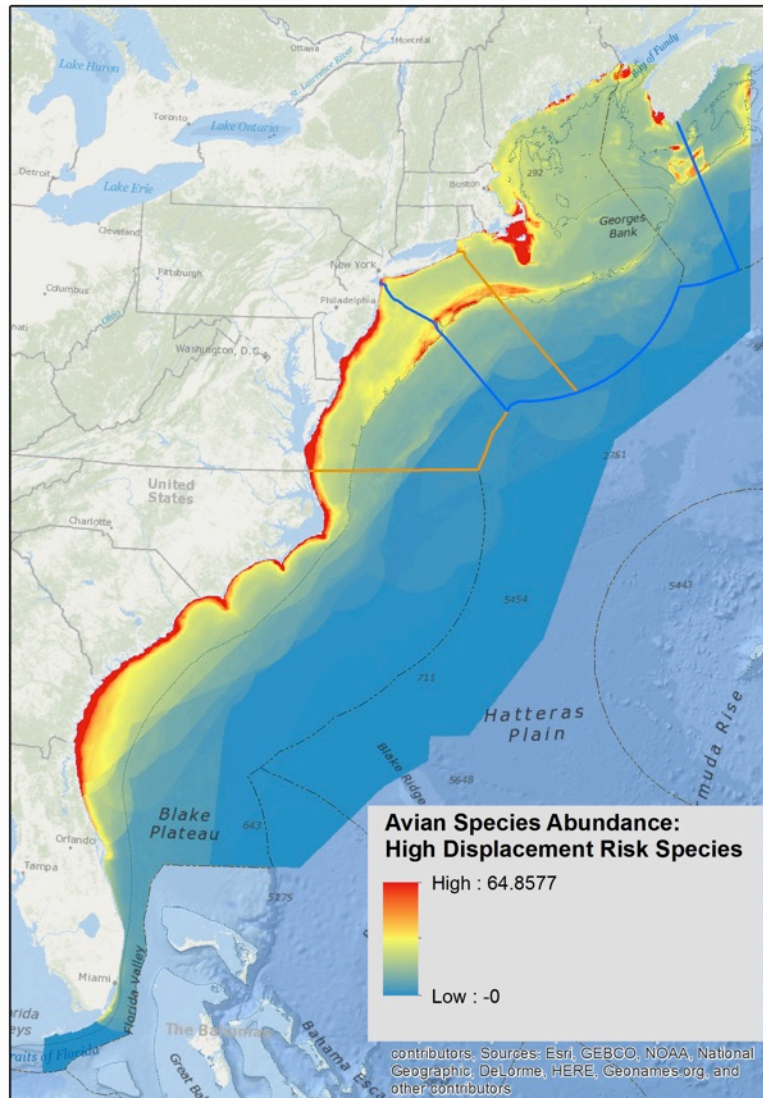


Functional hearing group	Estimated auditory bandwidth	Genera represented (Number species/subspecies)	Frequency-weighting network
Low-frequency cetaceans	7 Hz to 22 kHz	<i>Balaena</i> , <i>Caperea</i> , <i>Eschrichtius</i> , <i>Megaptera</i> , <i>Balaenoptera</i> (13 species/subspecies)	M_{lf} (lf: low-frequency cetacean)
Mid-frequency cetaceans	150 Hz to 160 kHz	<i>Steno</i> , <i>Sousa</i> , <i>Sotalia</i> , <i>Tursiops</i> , <i>Stenella</i> , <i>Delphinus</i> , <i>Lagenodelphis</i> , <i>Lagenorhynchus</i> , <i>Lissodelphis</i> , <i>Grampus</i> , <i>Peponocephala</i> , <i>Feresa</i> , <i>Pseudorca</i> , <i>Orcinus</i> , <i>Globicephala</i> , <i>Orcaella</i> , <i>Physeter</i> , <i>Delphinapterus</i> , <i>Monodon</i> , <i>Ziphius</i> , <i>Berardius</i> , <i>Tasmacetus</i> , <i>Hyperoodon</i> , <i>Mesoplodon</i> (57 species/subspecies)	M_{mf} (mf: mid-frequency cetaceans)
High-frequency cetaceans	200 Hz to 180 kHz	<i>Phocoena</i> , <i>Neophocaena</i> , <i>Phocoenoides</i> , <i>Platanista</i> , <i>Inia</i> , <i>Kogia</i> , <i>Lipotes</i> , <i>Pontoporia</i> , <i>Cephalorhynchus</i> (20 species/subspecies)	M_{hf} (hf: high-frequency cetaceans)

Southhall, B. *et al.* 2007. Marine Mammal Noise Exposure Criteria: Initial Scientific Recommendations. Aquatic Mammals.

Avian Abundance

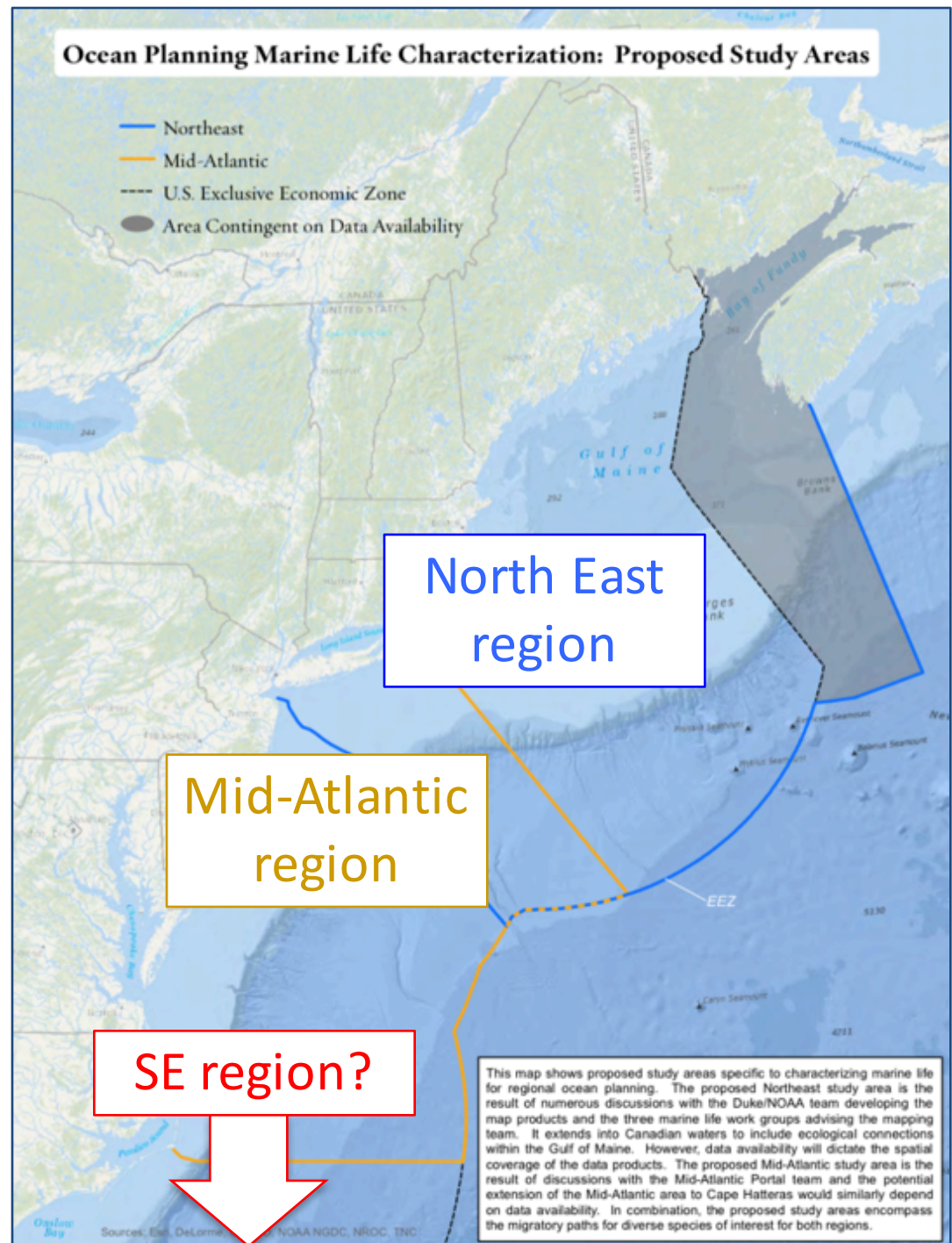
High Displacement Risk Species



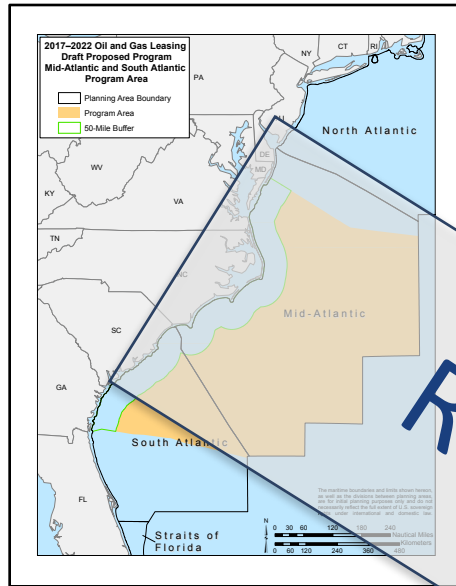
MDAT: Distribution and abundance of marine mammals, turtles, birds and fish

Broad, regional approach

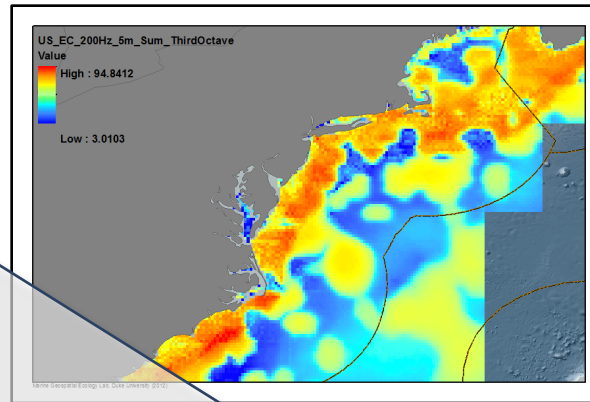
- Consistent
- Seamless
- Multi-scale



energy leasing

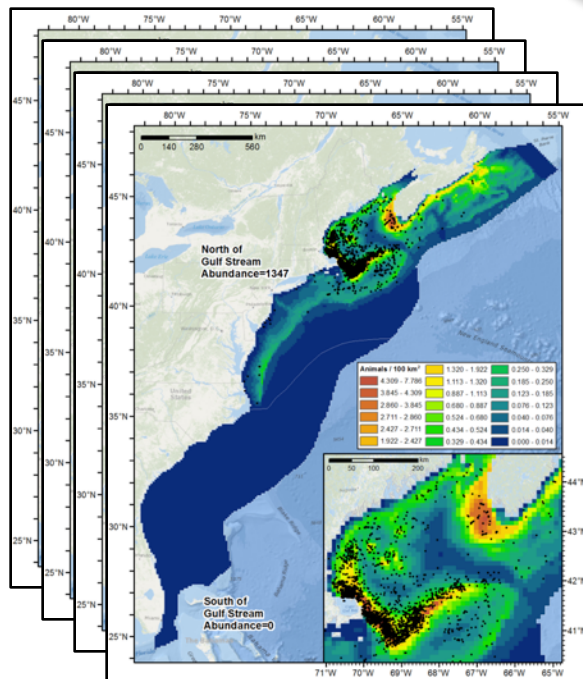


chronic noise

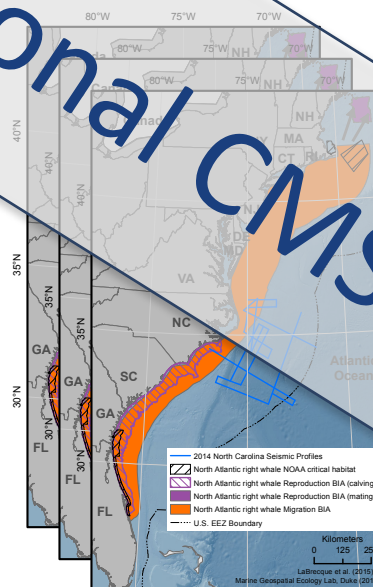


*Integrating disparate data
into regional coastal and
marine spatial planning
(CMSP)*

species densities

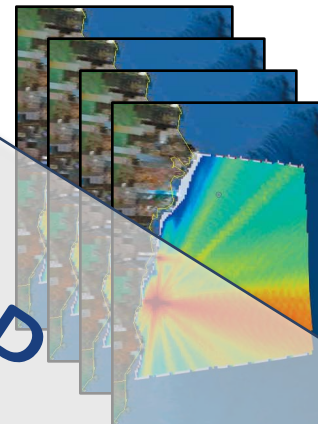


Regional CMSP



biologically important areas

event noise



multisector CMSP





Data Needs and Collaborative Opportunities

- Regional biological data synthesis
 - Extend MDAT work to the Southeast
 - IOOS BDP
 - SALCC Conservation Blueprint
- Marine spatial planning supporting management needs
 - Wind energy planning, Seismic survey permitting

Jesse Cleary

jesse.cleary@duke.edu

<http://mgel.env.duke.edu>

